

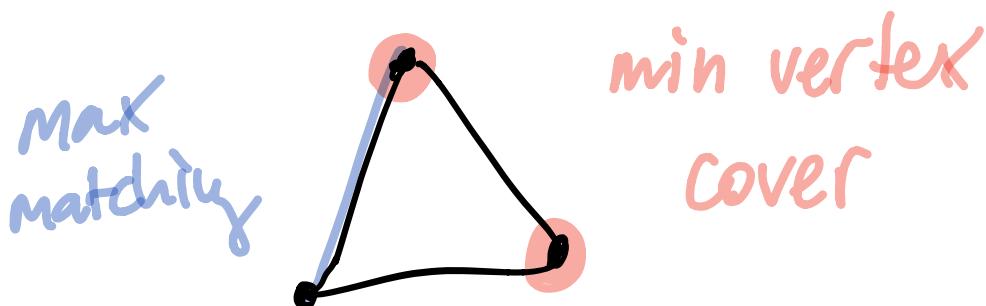
# 18.453 lecture 4 - 5

Lecture plan:

1. non-bipartite matchings.
  2. Tutte-Berge
  3. Algorithmic proof  
(Edmonds' alg)
- \* might not finish!

# Non-bipartite Matching

- Given  $G = (V, E)$ ;  
do not assume bipartite.
- Want maximum matching  $M$  in  $G$ .
- König's theorem doesn't hold:  
 $\text{max matching} \not\leq \text{min vertex cover}$ .



- Recall from lecture 1: instead, duality w/ obstructions based on parity.

# Tutte-Berge Formula

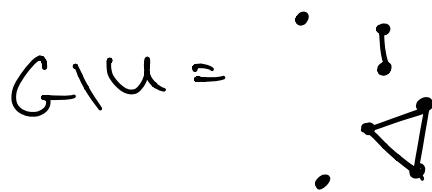
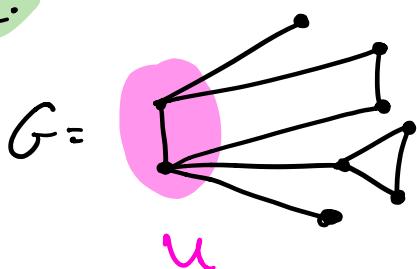
Given  $U \subseteq V$ ,

Def

$G \setminus U := G$  after deleting  $U$  &  
all adjacent edges.

$\circ(G \setminus U) :=$  # odd connected  
components in  $G \setminus U$

E.g.



$$\circ(G \setminus U) = \circ\left(\begin{array}{c} \bullet \\ \vdots \\ \bullet \end{array} \quad \text{triangle} \quad \bullet \right) = 3$$

Thm (Tutte-Berge Formula):

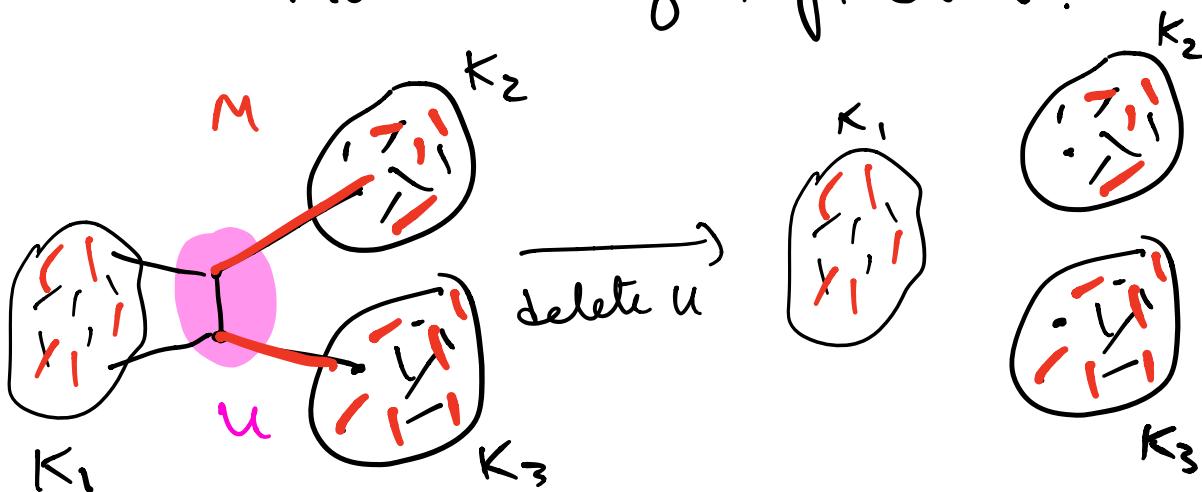
$$\max_{\text{matching } M} |M| = \min_{U \subseteq V} \frac{1}{2}(|V| + |U| - o(G|V|))$$

#edges      was missing in lec 1

Pf ( $\leq$ ) i.e. "weak duality"

- Deleting  $U$  deletes  $\leq |U|$  edges of  $M$ .

How many left over?



- # left over is at most

$$\sum_{i=1}^3 \left\lfloor \frac{|K_i|}{2} \right\rfloor.$$

- Thus, if  $K_1, \dots, K_k$  are connected components of  $G \setminus U$ ,

\*  $|M| \leq |U| + \sum_{i=1}^k \left\lfloor \frac{|K_i|}{2} \right\rfloor.$

- Can rewrite:  $\left\lfloor \frac{|K_i|}{2} \right\rfloor = \begin{cases} \frac{|K_i|}{2} & \text{if } |K_i| \text{ even} \\ \frac{|K_i|-1}{2} & \text{else.} \end{cases}$

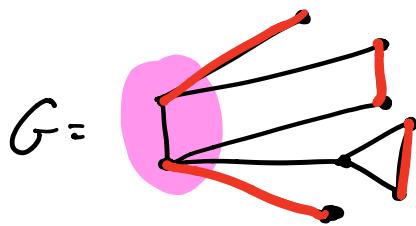
thus \*\* 
$$\sum_{i=1}^k \left\lfloor \frac{|K_i|}{2} \right\rfloor = \sum_{i=1}^k \frac{|K_i|}{2} - \frac{1}{2} o(G \setminus U).$$
  

$$= \frac{|N| - |U| - o(G \setminus U)}{2}.$$

- Plugging  $\star\star$  into  $\star$  gives

$$|M| \leq \frac{1}{2}(|V| + |U| - o(G \setminus u)) \quad \square$$

E.g.



$$\begin{aligned} |M| &= 4, & \frac{1}{2}(|V| + |U| - o(G \setminus u)) \\ & & = \frac{1}{2}(9 + 2 - 3) = 4. \end{aligned}$$

## Proof of $\geq ??$

- Beautiful algorithm due to Edmonds.
- challenge: though still true that

*Carefully look at proof from lec 2!*

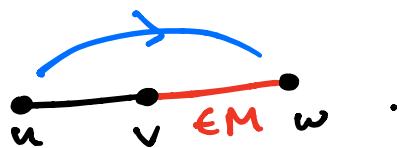
$M$  maximum  $\iff$  no aug. path w.r.t  $M$ ,

finding the paths is hard.

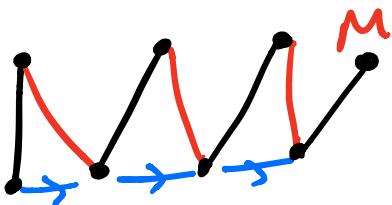
- Why? Natural approach repeats vertices.

Natural approach: whenever you

see  add directed edge  $uw$ :



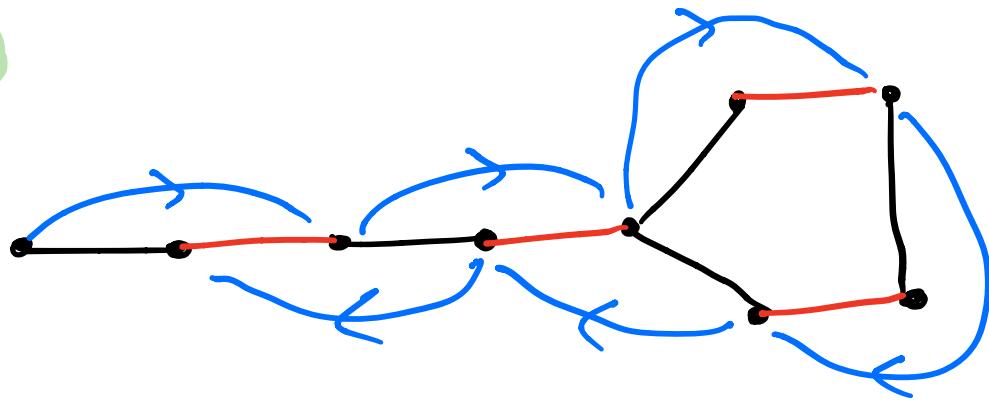
E.g.



Then, start at exposed vertex & look for vertex adjacent to an exposed vertex in blue digraph.

Problem: can lead to repeated vertices.

E.g.



when we first repeat,  
have found a

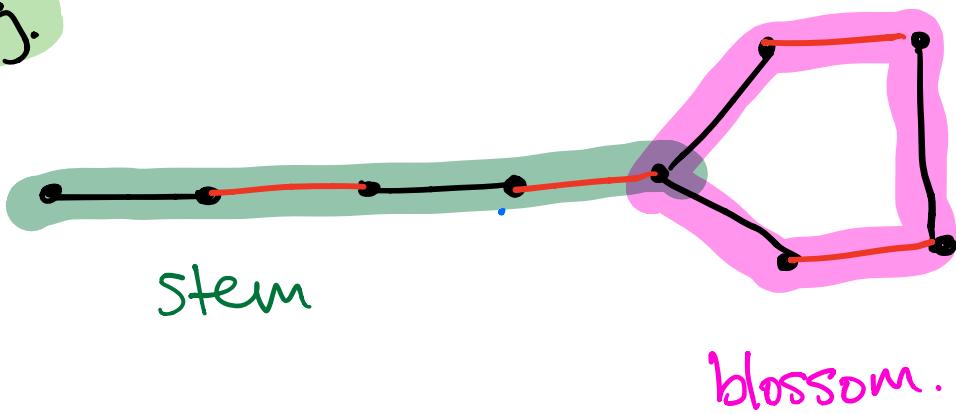
flower (with respect to  $M$ ):

Stem: even-length  
alternating path  
from exposed  $u$  to  
vertex  $v$

Blossom: odd length  
cycle intersecting  
stem in  $v$ ,  
alternating except  
for edges incident

to  $V$ .

E.g.



## Algorithm idea:

At each step, have matching  $M$ .

- find aug. path or flower w.r.t  $M$  or show neither exists.
- If neither exists, Matching is maximum.
- if aug. path, augment & repeat.

- if flower, let  $B$  be blossom.

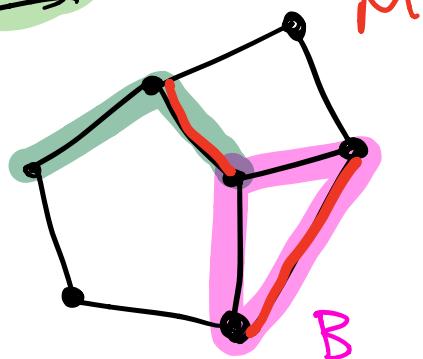
Create graph  $G/B$  (not  $G \setminus B$ )

Called contraction where

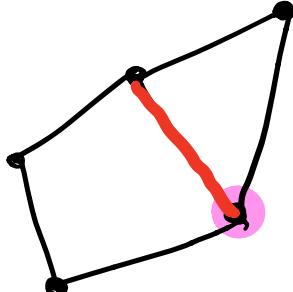
①  $B$  shrunk to single vertex  $b$ .

② edges  $(u, v)$  for  $u \notin B, v \in B$   
replaced by  $(u, b) \in G \setminus B$ .

E.g.



$M \setminus B$



$G$

$G/B$ .

Note: is matching  $M/B$  in  $G/B$

and  $|M| - |M/B| = \frac{|B|-1}{2}$ .

(i.e. # edges of  $M$  in  $B$ ).

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Crucial Theorem: Let  $B$  be a

blossom w.r.t.  $M$ . Then

$M$  max. matching in  $G$



$M \setminus B$  max. matching in  $G \setminus B$ .

---

Proof will be algorithmic:

If bigger matching in  $G \setminus B$  than

$M \setminus B$ , can use it to find bigger matching in  $G$  than  $M$ .

Theorem  $\rightarrow$  Algorithm: recursion!

Assuming we can find either any path or blossom, can recurse to increase size of  $M \setminus B$  in  $G \setminus B$ .

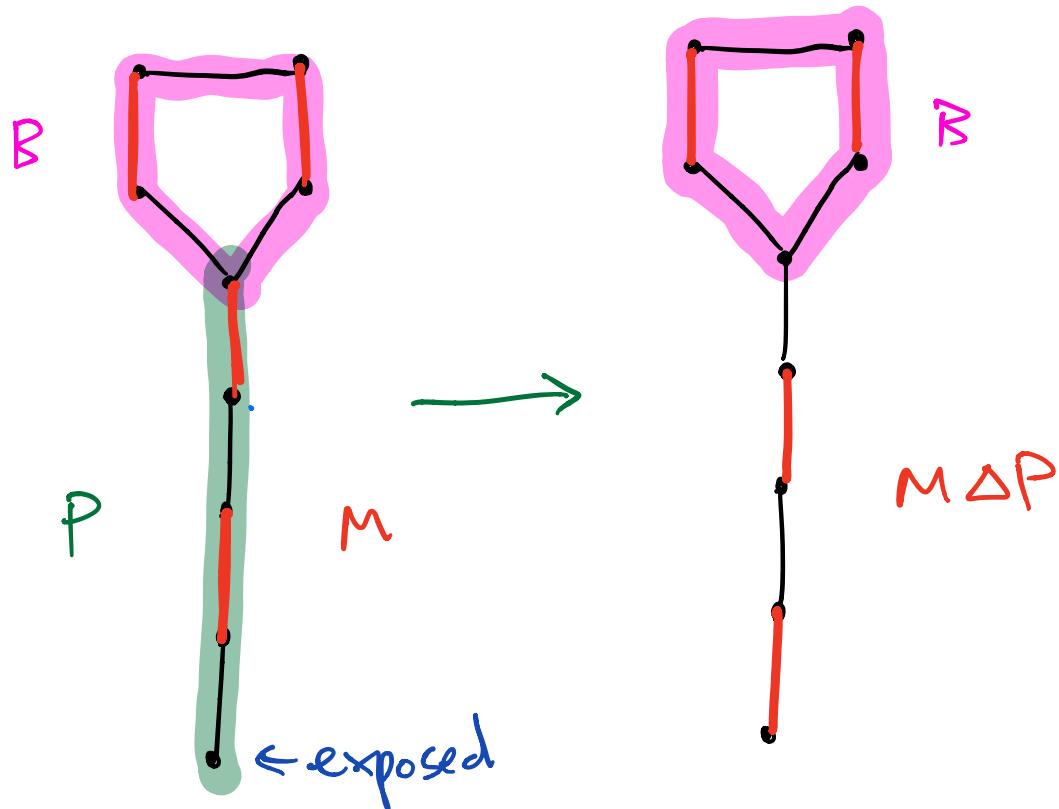
- if not possible,  $M$  maximum.
- else, use new matching in  $G \setminus B$  to increase  $M$ .

Proof of Crucial Theorem!

⑥ W.L.O.G. assumption:

$B$  has empty stem  $P$ !

why w.l.o.g? If  $P$  nonempty,  
look at  $M\Delta P$ .



- $M\Delta P$  has empty stem & blossom  $P$ .

- Proving theorem for  
 $M\Delta P$  also proves  
 for  $M$ :

$M$  maximum in  $G$

P alternating



$M\Delta P$  maximum in  $G$

theorem



$M\Delta P/B$  max in  $G/B$

$$M\Delta P/B = (M/B)\Delta P$$

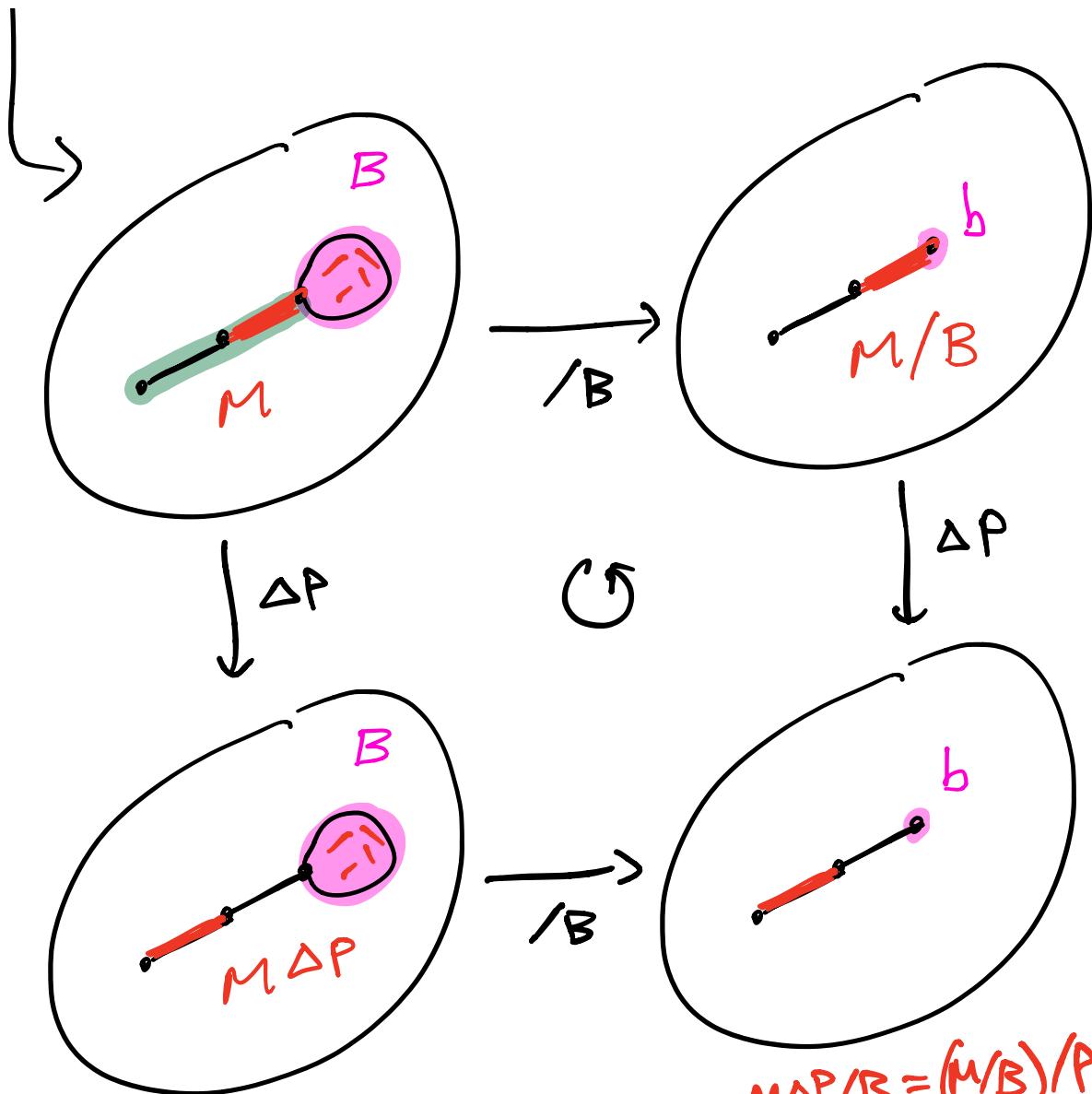


$(M/B)\Delta P$  max in  $G/B$

P alternating



$(M/B)$  max in  $G/B$ .



$$M \Delta P / B = (\mu / B) / R.$$

Finally, start proof. Recall Thm:

$M$  max. in  $G$

$\Leftrightarrow M / B$  max in  $G / B$

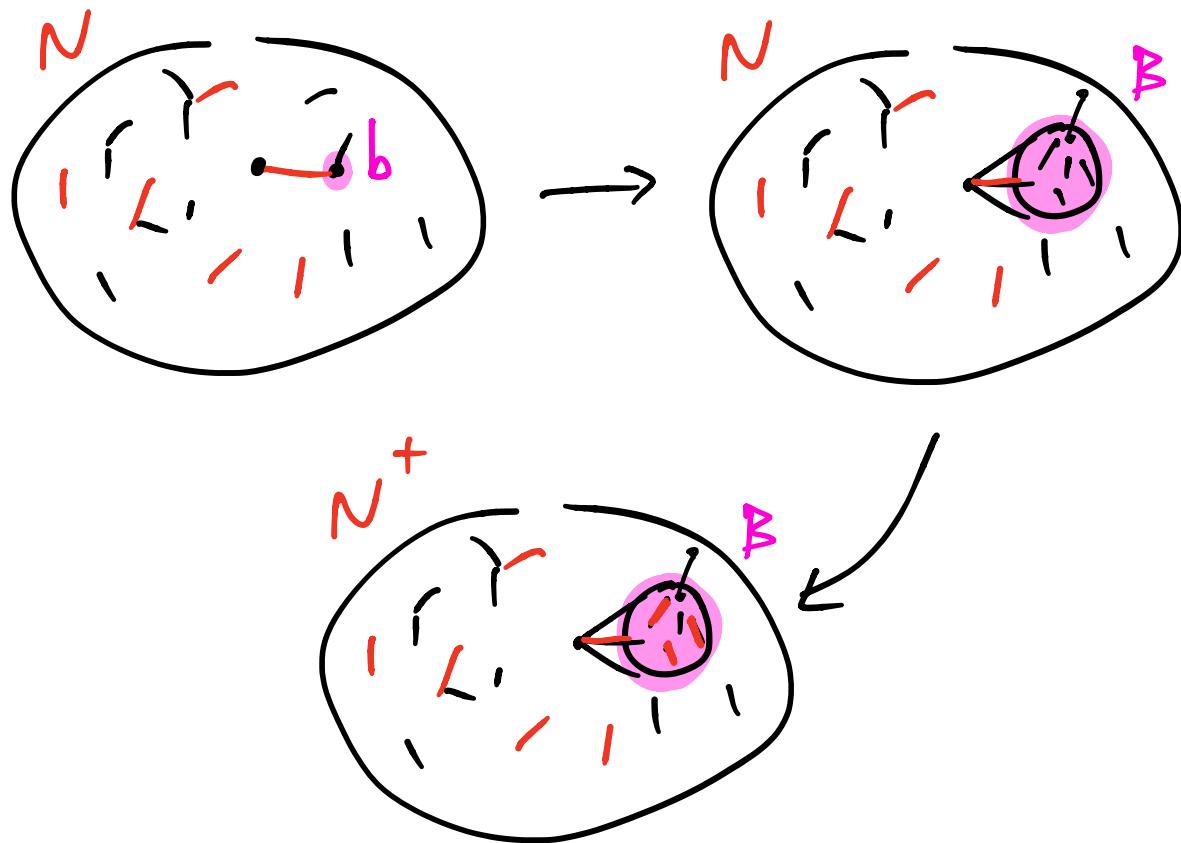
①  $(\Rightarrow)$

Suppose  $N$

is matching  $G/B$  larger  
than  $M/B$ .

- pull back  $N$  to  
matching in  $G$ ;  $B$   
incident to  $\leq 1$  vertex  
of  $B$ .
- Expand to matching  $N^+$   
in  $G$  by adjoining

$\frac{1}{2}(|\beta| - 1)$  edges to match  
remaining vertices of  $\beta$ .



$|N^+|$  exceeds  $|M|$  by same  
amt.  $|N|$  exceeds  $|M/\beta|$ .

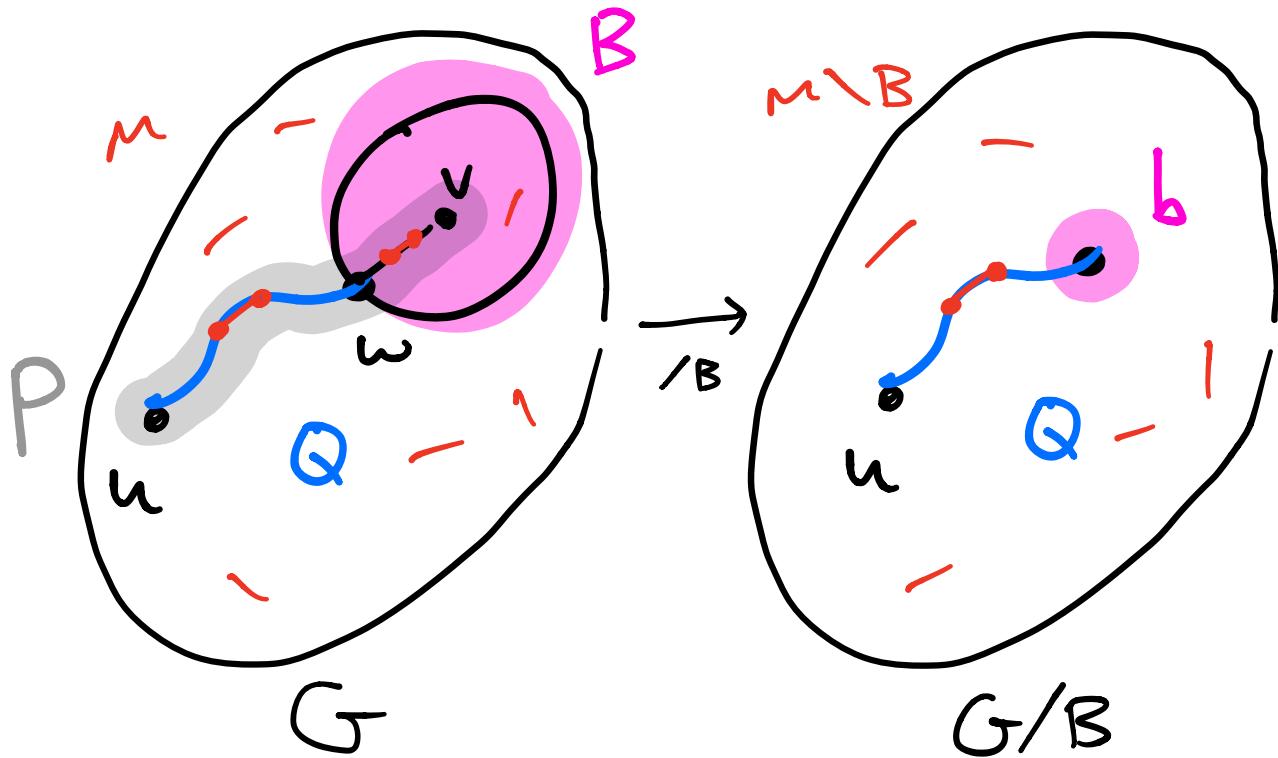
2. ( $\Leftarrow$ )

Contrapositive: if  $M$   
not max,  $M \setminus B$  not  
max.

Suppose  $M$  not max in  $G$ .

- Then  $\exists$  aug path  $P$  between exposed verts  $u, v$ .
- w log  $u \notin B$ ,  
b/c  $B$  has 1 exposed vertex.  
(empty stem)
- $\omega := \begin{cases} \text{first vertex of } P \text{ in } B \\ (\text{starting at } u) \end{cases}$   
 $v$ ; if  $P, B$  share no vertices.
- $Q :=$  part of  $P$  between  $u, \omega$ .
- $Q$  augmenting path in  $M \setminus B$

b/c  $b$  exposed in  $M/B$ .



if  $P, B$  vertex disjoint,  $v$  still exposed.

Augmenting  $M/B$  along  $Q \Rightarrow$   
Thus  $M/B$  not maximum.  $\square$

Note! itn doesn't say  
maximum matching  $M^*$  in  $G/B$

$\rightsquigarrow$  max matching  $M$  in  $G$

by adding  $\frac{|B|-1}{2}$  edges

from  $B$  to  $M^*$ .

Ex. find example of this;  
explain why no contradiction.

Finally, ready to give algorithm.

# Lecture 5

Plan:

1. finish Edmonds' nonbipartite matching alg.
2. Use to prove Tutte's theorem.

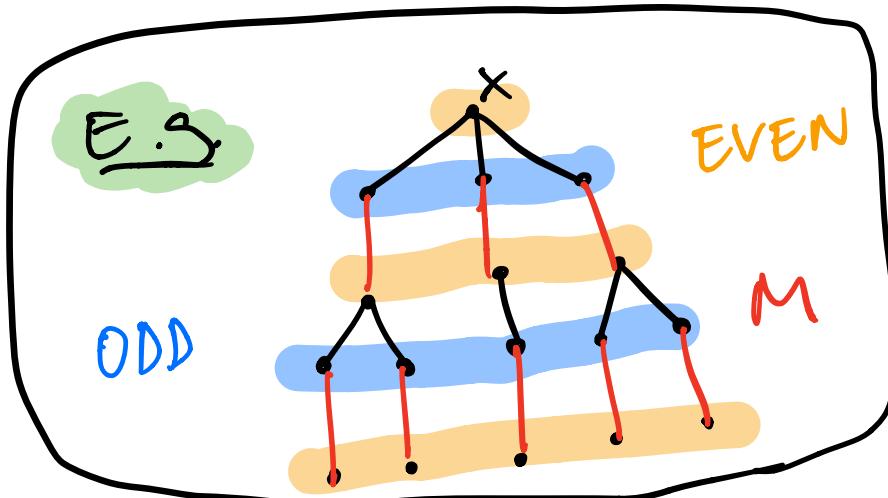
## Edmonds' Algorithm

Given  $M$ , find aug path/flower.

- Label exposed vertices EVEN;

Keep others unlabelled initially.  
(eventually will label others ODD/EVEN).

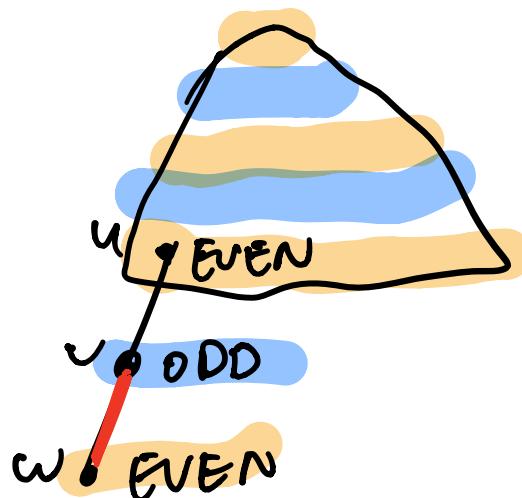
- Maintain alternating forest:  
graph in which each connected  
component is alternating tree (AT)  
i.e. tree w/ paths to root
  - i) alternating w.r.t M.
  - ii) alternating b/w ODD & EVEN.



- Process EVEN vertices  
one at a time. If

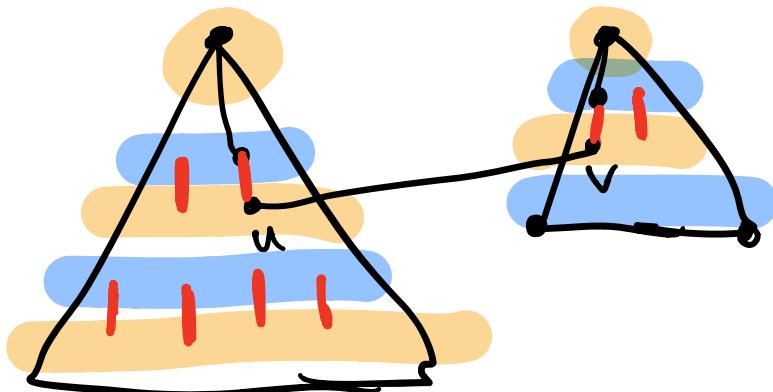
currently processing  $u$ ,  
cases based on neighbors of  $u$ .

- ① If edge  $(u,v)$  with
- ✓ unlabelled, label
  - ✓ ODD. ✓ not exposed  
(b/c else ✓ EVEN); So
- label  $v$ 's mate  $w$  EVEN.  
Add  $(u,v), (v,w)$  to  $u$ 's AT.



⑥ if  $\exists$  edge  $(u, v)$  s.t.  
 $v$  EVEN and  $v$   
belongs to different AT  
than  $u$ :

Then  $\exists$  any path  
between the roots!

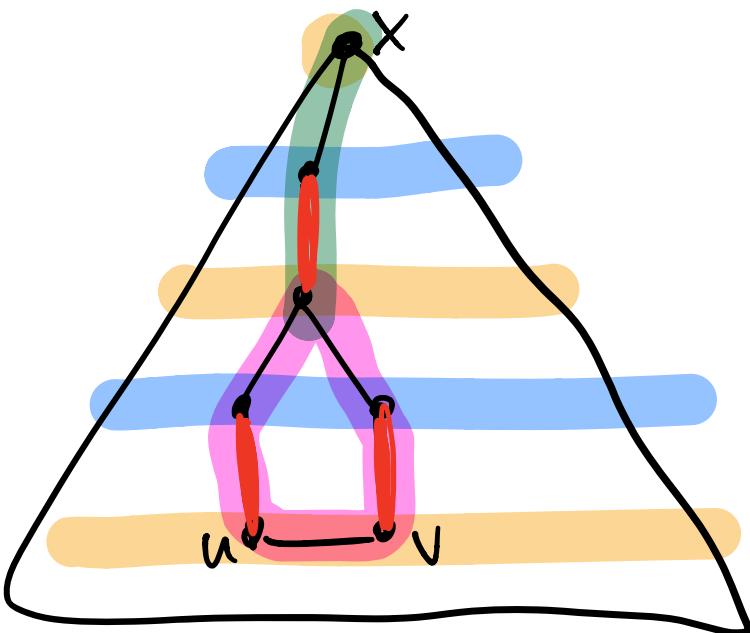


have found any path; increase  
 $M$ , start over with new  $M_0$ .

c) If is edge labeled  $(u, v)$   
with  $v$  labeled EVEN  
&  $v$  in same AT as  $u$ ,

---

then: two paths from  
 $u, v$  to (exposed) root  $x$   
form a flower.



Shrink to  $G \setminus B$ ,  
recursively find max.  
Matching in  $G \setminus B$ , use  
it to increase  $M$   
using the crucial theorem.  
Start over w/ new  $M$ .

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Correctness: Suppose none

of a, b, c apply anymore for  
the EVEN vertices.

Claim: Current matching  $M_K$

is max in current  $G_k = (V_k, E_k)$

$$G_k := G / B_1 / B_2 / \dots / B_K$$

$\underbrace{\phantom{B_1 / B_2 / \dots / B_K}}_{G_i}$

for  $B_i$  blossom in  $G_{i-1}$ .

Proof of Claim: Consider  $U = \text{ODD}$

and consider the upper bound  
from Tutte-Berge for  $G'$ ,

$$|M'| \leq \frac{1}{2} \left[ |V'| + |U| - o(G' \setminus U) \right].$$

- No edges b/w EVEN vertices  
(else (b) or (c) applies).
- & no edges b/w EVEN & unlabelled  
(else (a) applies).
- Thus, EVEN are singleton components in  $G' \setminus U$ ,

$$\text{so } \circ(G' \setminus \text{ODD}) = |\text{EVEN}| *$$

- Further, all unlabelled vertices matched, so

$$|M'| = |\text{ODD}| + \frac{1}{2}(|V'| - |\text{ODD}| - |\text{EVEN}|)$$

\*\*

$$= \frac{1}{2}(|V'| + |\text{ODD}| - |\text{EVEN}|)$$

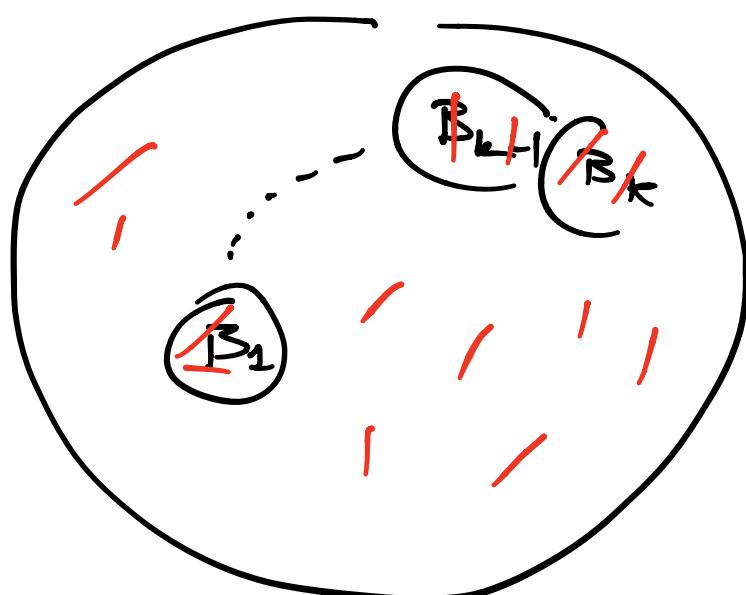
- Plug \* into \*\*:

$$|M'| = \frac{1}{2}(|V'| + |\text{ODD}| - |\text{EVEN}|)$$

$$= \frac{1}{2}(|V'| + |\text{ODD}| - \circ(G' \setminus \text{ODD})).$$

Tutte-Berge (upper bound)  $\Rightarrow$

$M'$  max in  $G'$ . Applying  
crucial theorem repeatedly  
for  $B_k B_{k-1} \dots B_1$ ,  
shows algorithm constructs  
maximum matching in  $G$ .  
because  $B_i$  was blossom in  $G_{i-1}$



# Running time.

- Algorithm performs  $\leq \frac{n}{2}$  augmentations of matching "outer loop"
- between two augmentations, "inner loop" shrinks blossom  
 $\leq \frac{n}{2}$  times (shrinks by  $\geq 2$  vertices).
- Time to construct  $A\bar{I}$  is  $O(m)$ ,  $m := |E|$ .

[So overall,  $O(n^2m)$ .]

## Proof of Tutte-Berge $\geq$

We've argued TB holds for graph  $G_k$  for which alg. terminates.

- Recall  $G_i$  obtained from shrinking blossoms  $B_1, \dots, B_i$ , let  $M_i$  corresp. matching.  
 $G_0 := G$ .

- We saw TB holds for  $G_k$ , i.e.

$$|M_k| = \frac{1}{2}(|V_k| + |U| - |G_k \setminus U|)$$

where  $U = \text{ODD}$ ,

b/c  $G_k \setminus \text{ODD} = \text{EVEN}$ ;  
singletons components.

- Unshrink  $B_i$ , one at a time, induct backwards.

In step  $G_i \rightarrow G_{i-1}$ :

(i)  $|V_{i-1}| = |V_i| + |B_i| - 1$

and

$\uparrow$   
itself.

$$|M_{i-1}| = |M_i| + \frac{1}{2}(|B_i|-1).$$

(ii)

Unshrink  $B_i$

adds even  $(|B_i|-1)$

vertices to some C.C.

of  $G_i \setminus U$ , so # odd/even

components stays same.

i.e.

$$\boxed{o(G_i \setminus U) = o(G_{i-1} \setminus U)}.$$

(iii) Using this, when  $i < i-1$

the RHS & LHS of

$$|M_i| = \frac{1}{2} (|V_i| + |U| - o(G_i \setminus U))$$

increase by  $\frac{1}{2} (|\beta_i| - 1)$ .

By induction,

$$|M_0| = \frac{1}{2} (|V_0| + |U| - o(G_0 \setminus U)).$$



Corollary of Tutte-Berge!

$G$  has P.M. iff

$$\forall U, \alpha(G \setminus U) \leq |U|.$$

This is called

Tutte's matchingthm.

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